#### The Manticore Approach to Parallelism

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#### The hardware environment is heterogeneous and in flux:

- Microprocessors have become multiprocessors.
- Quad-core is standard on the desktop; 8-core by year's end
- Larrabee is rumored to have 32 cores
- ► Heterogeneous processors (Cell and GPU)

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- Need high-level constructs to hide hardware details
- Support for heterogeneous applications
- Opportunity for functional programming (again)
- Challenge: efficient implementation on a range of hardware platforms.



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#### People

The Manticore project is a joint project between the University of Chicago and the Rochester Institute of Technology.

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#### with help from

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## Our initial design is purposefully conservative. It can be summarized as the combination of three distinct sub-languages:

- A mutation-free subset of SML (no refs or arrays, but includes exceptions).
- Language mechanisms for implicitly-threaded parallel programming.
- Language mechanisms for explicitly-threaded parallel programming (a.k.a. concurrent programming) based on message passing (not MPI).

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Manticore provides several light-weight syntactic forms for introducing parallel computation.

- Parallel arrays provide fine-grain data-parallel computations over sequences.
- Parallel tuples provide a basic fork-join parallel computation.
- Parallel bindings provide data-flow parallelism with cancelation of unused subcomputations.
- ▶ Parallel case provides non-deterministic speculative parallelism.



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#### Parallel arrays

We support fine-grained nested-data-parallel (NDP) computation using a parallel array comprehension form (NESL/Nepal/DPH):

```
[| exp | pat; in exp; where pred |]
```

For example, the parallel point-wise summing of two arrays:

```
[| x+y | x in xs, y in ys |]
```

**NOTE:** zip semantics, not Cartesian-product semantics.

This construct can be mapped onto SIMD type hardware (GPUs).

#### Nested data parallelism (continued ...)

#### Mandelbrot set computation:

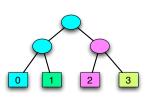
```
fun x i = x0 + dx * Float.fromInt i;
fun y j = y0 - dy * Float.fromInt j;
fun loop (cnt, re, im) =
    if (cnt < 255) andalso (re*re + im*im > 4.0)
        then loop(cnt+1, re*re - re*im + re, 2.0*re*im + im)
        else cnt;
[[
    [| loop(0, x i, y j) | i in [| 0..N |] |]
    | j in [| 0..N |]
]
```

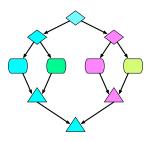
#### Irregular parallelism

```
type sparse_matrix = (int * float) parray parray
fun sparseDotP (sv, v) = sumP [| x * v!i | (i, x) in sv |]
fun smxv (sm, v) = [| sparseDotP(row, v) | row in sm |]
```

#### Parallel tuples

Parallel tuples provide fork-join parallelism. For example, consider summing the leaves of a binary tree.





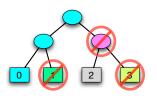
#### Parallel bindings

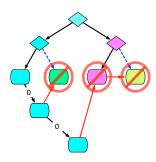
Parallel bindings provide more flexibility than parallel tuples. For example, consider computing the product of the leaves of a binary tree.

```
fun treeMul (LF n) = n
  | treeMul (ND(t1, t2)) = let
    pval b = treeMul t2
    val a = treeMul t1
    in
        if (a = 0) then 0 else a*b
    end
```

**NOTE:** the computation of b is speculative.

## Parallel bindings (continued ...)



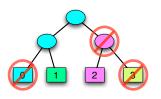


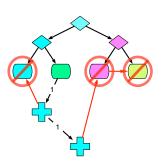
#### Parallel case

Parallel case supports speculative parallelism when we want the quickest answer (e.g., search problems). For example, consider picking a leaf of the tree:

There is some similarity with join patterns.

## Parallel case (continued ...)





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#### Symmetric version of treeMul.

```
fun treeMul (LF n) = n
| treeMul (ND(t1, t2)) = (
    pcase treeMul t1 & treeMul t2
    of ? & 0 => 0
        | 0 & ? => 0
        | a & b => a*b)
```

#### Discussion

- ▶ These mechanisms compose.
- Value-oriented computation model
- Use tree-structure (ropes) for parray type.
- ► Futures with Cilk-style work stealing plus cancelation
- Working on size analysis to manage granularity



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- We have a prototype implementation for the x86-64 processor (Linux and Mac OS X).
- Demonstrated scalable performance on 16-core system (4 quad-core AMD 8380 processors) vs. good sequential implementations.
- Sequential performance is okay, but needs improvement.

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- Mapping NDP constructs onto GPUs.
- Better support for speculative parallelism.
- Support for controlled use of mutation for shared data structures.
- Ongoing work to improve sequential performance.

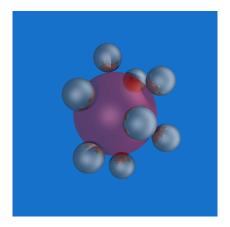
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#### Questions?



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